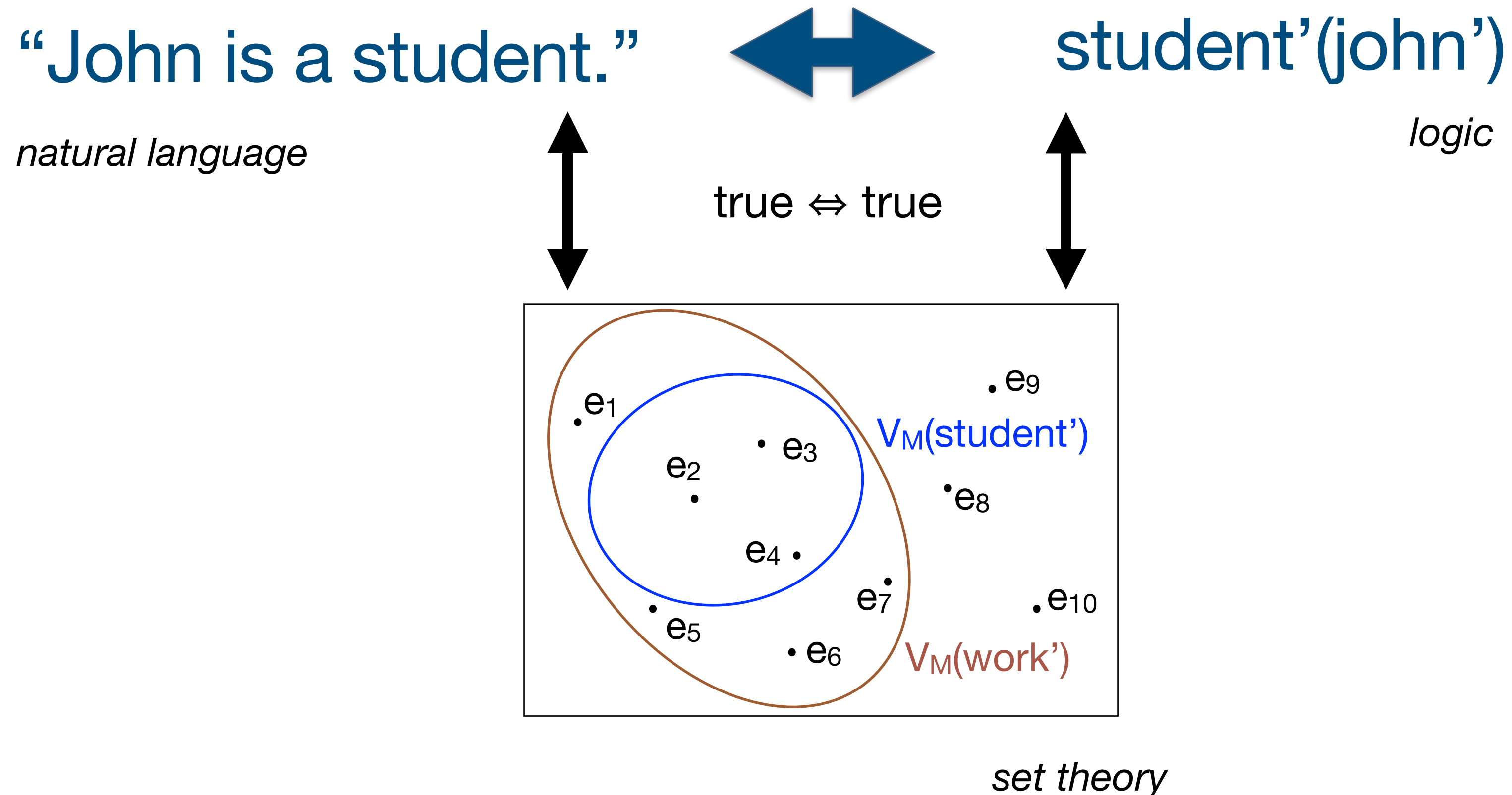


# Semantic Theory

## Week 2: Type Theory

# Truth-conditional semantics

**Assumption:** Logical formula captures truth-conditions of NL sentence; they are true in the same possible models.



# Truth, validity and entailment

- A formula  $\varphi$  is **true** in a model  $M$  iff:  
 $\llbracket \varphi \rrbracket^{M,g} = 1$  for every variable assignment  $g$
- A formula  $\varphi$  is **valid** ( $\models \varphi$ ) iff:  
 $\varphi$  is true in all models
- A formula  $\varphi$  is **satisfiable** iff:  
there is at least one model  $M$  such that  $\varphi$  is true in  $M$
- A set of formulas  $\Gamma$  **entails** formula  $\varphi$  ( $\Gamma \models \varphi$ ) iff:  
 $\varphi$  is true in every model in which all formulas in  $\Gamma$  are true
  - the elements of  $\Gamma$  are called the **premises** or **hypotheses**
  - $\varphi$  is called the **conclusion**

# First-order logic

## Predication and quantification over individual entities

- First-order logic talks about:
  - Individual objects:  $\forall_M(\text{john}') \in U_M$ ;  $g(x) \in U_M$
  - Properties of and relations between individual objects:  $\text{happy}'(\text{john}')$ ;  $\text{love}'(\text{john}', \text{mary}')$
  - Quantification over individual objects:  $\forall x(\text{happy}(x))$

# Limitations of first-order logic

FOL is not expressive enough to capture all meanings that can be expressed by basic natural language expressions:

- Jumbo is a small elephant. (Predicate modifiers)
- Being rich is a state of mind. (Second-order predicates)
- Yesterday, it rained. (Non-logical sentence operators)
- Bill and John have the same hair color. (Higher-order quantification)

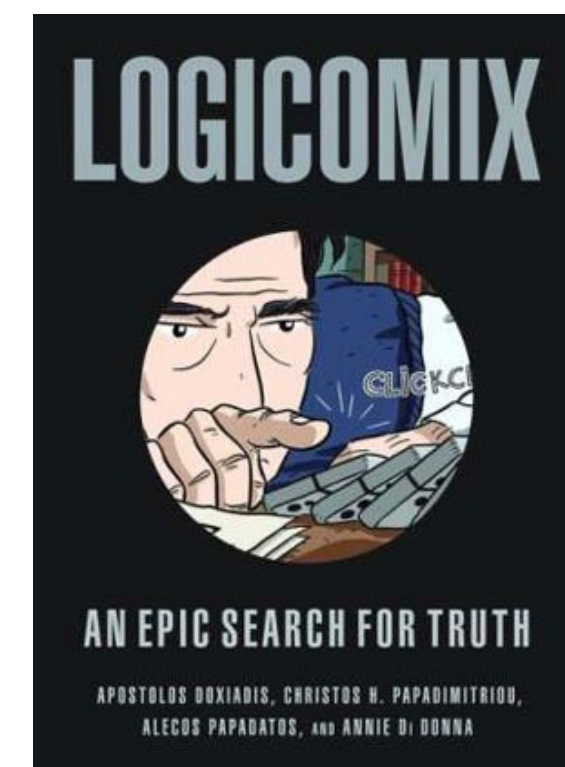
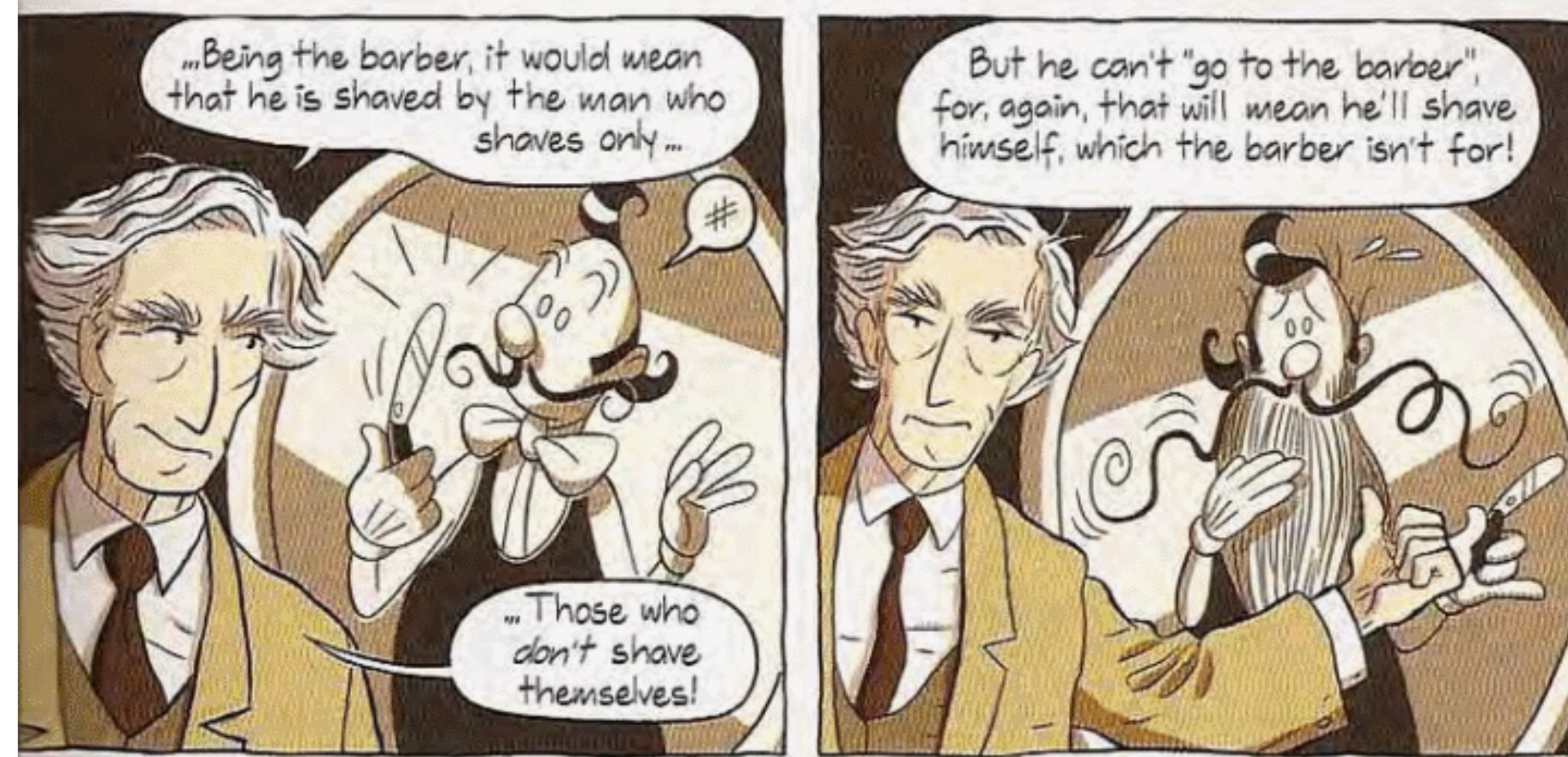
→ What system can capture this diversity?

Simple idea: introduce higher order predication & quantification



# Introducing Russell's paradox

Bertrand Russell



From: **Logicomix — An epic search for truth**; A. Doxiadis, C.H. Papanimitriou, A. Papadatos and A. Di Donna



# Problem for higher-order predicate logic

## Russell's paradox

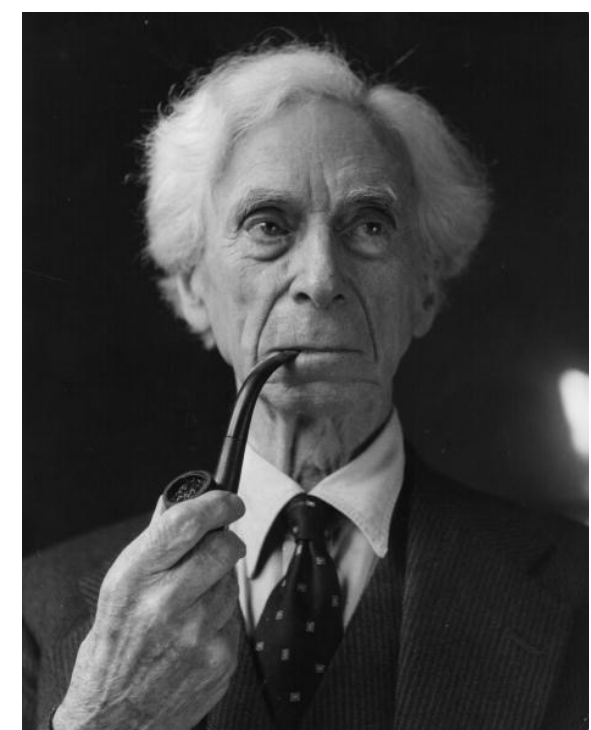
What if we extend the FOL interpretation of predicates, and simply interpret higher-order predicates as sets of sets of properties?

- For every predicate  $P$ , we define a set  $\{x \mid P(x)\}$  containing all and only those entities for which  $P$  holds; higher order predicates are defined as sets of sets, e.g.,  $\{P \mid H(P)\}$
- This means that we can formally define a set  $S = \{X \mid X \notin X\}$  representing the set of all sets that are not members of itself

- **Paradox:** does  $S$  belong to itself?

If it does, then  $S$  must satisfy its constraints, namely that it doesn't belong to itself, which is not possible if we assume it belongs to  $S$ . If not, then  $S$  is a set that doesn't belong to itself, hence it belongs to  $S$ .

→ **Conclusion:** We need a more restricted way of talking about *properties and relations between properties!*



Bertrand Russell  
1872 – 1970  
Venhúizen & Brouwer

# Type Theory

## Basic and complex types

- In Type Theory, all non-logical expressions are assigned a *type* (that may be basic or complex), which restricts how they can be combined.

- Basic types:

- **e** – the type of individual terms (“entities”)
- **t** – the type of formulas (“truth-values”)

- Complex types:

- If  $\pi$ ,  $\sigma$  are types, then  $\langle \pi, \sigma \rangle$  is a type

This represents a functor expression that takes an expression of type  $\pi$  as its argument and returns an expression of type  $\sigma$ ; this functor is sometimes written as  $(\pi \rightarrow \sigma)$  or simply  $(\pi\sigma)$



Alonzo Church  
1903 – 1995  
Venhuizen & Brouwer



# Type Theory

## Types & Function Application

Winter: EFS Ch3  
Page 53

Types for first-order expressions:

- Individual constants (Luke, Death Star) :  $\mathbf{e}$  (Entity)
- One-place predicates (to walk, to be a jedi):  $\langle \mathbf{e}, \mathbf{t} \rangle$  (Function from entities to truth values; a property)
- Two-place predicates (to admire, to fight with):  $\langle \mathbf{e}, \langle \mathbf{e}, \mathbf{t} \rangle \rangle$  (Function from entities to properties)
- Three-place predicates (to give, to introduce):  $\langle \mathbf{e}, \langle \mathbf{e}, \langle \mathbf{e}, \mathbf{t} \rangle \rangle \rangle$  (Function from entities to functions from entities to properties)

**Function application:** Combining a functor of complex type  $\langle \boldsymbol{\pi}, \boldsymbol{\sigma} \rangle$  with an appropriate argument of type  $\boldsymbol{\pi}$ , results in an expression of type  $\boldsymbol{\sigma}$ :  $\langle \boldsymbol{\pi}, \boldsymbol{\sigma} \rangle(\boldsymbol{\pi}) \mapsto \boldsymbol{\sigma}$

- $\text{jedi}'(\text{luke}') :: \langle \mathbf{e}, \mathbf{t} \rangle(\mathbf{e}) \mapsto \mathbf{t}$  (“luke is a jedi”: statement that has a truth value)
- $\text{admire}'(\text{luke}') :: \langle \mathbf{e}, \langle \mathbf{e}, \mathbf{t} \rangle \rangle(\mathbf{e}) \mapsto \langle \mathbf{e}, \mathbf{t} \rangle$  (“[to] admire luke” is a property)

# More examples of types

## Higher-order expressions

- Predicate modifiers (expensive, small):  $\langle\langle\mathbf{e}, \mathbf{t}\rangle, \langle\mathbf{e}, \mathbf{t}\rangle\rangle$  (Function from properties to properties)
- Second-order predicates (state of mind):  $\langle\langle\mathbf{e}, \mathbf{t}\rangle, \mathbf{t}\rangle$  (Property of properties)
- Sentence operators (yesterday, unfortunately):  $\langle\mathbf{t}, \mathbf{t}\rangle$  (Function from truth values to truth values)
- Degree particles (very, too):  $\langle\langle\langle\mathbf{e}, \mathbf{t}\rangle, \langle\mathbf{e}, \mathbf{t}\rangle\rangle, \langle\langle\mathbf{e}, \mathbf{t}\rangle, \langle\mathbf{e}, \mathbf{t}\rangle\rangle\rangle$  \*complex function\*

If  $\pi, \sigma$  are basic types,  $\langle\pi, \sigma\rangle$  can be abbreviated as  $\pi\sigma$ . The types of predicate modifiers and second-order predicates can then be more conveniently written as:  $\langle\mathbf{et}, \mathbf{et}\rangle$  and  $\langle\mathbf{et}, \mathbf{t}\rangle$ .



# Type Theory: Vocabulary

- **Non-logical constants:**

A (possibly empty) set of non-logical constants for every type  $\sigma$ :  $\text{CON}_\sigma$  such that the sets for all distinct types are pairwise disjoint

- **Variables:**

An infinite set of variables For every type  $\sigma$ :  $\text{VAR}_\sigma$  (pairwise disjoint)

- **Logical symbols:**  $\forall, \exists, \neg, \wedge, \vee, \rightarrow, \leftrightarrow, =$

- **Brackets:**  $(, )$

# Type Theory: Syntax

**For every type  $\sigma$** , the set of well-formed expressions  $WE_\sigma$  is defined as follows:

- (i)  $CON_\sigma \subseteq WE_\sigma$  and  $VAR_\sigma \subseteq WE_\sigma$ ;
- (ii) If  $\alpha \in WE_{\langle \pi, \sigma \rangle}$ , and  $\beta \in WE_\pi$ , then  $\alpha(\beta) \in WE_\sigma$ ;      (function application)
- (iii) If  $A, B$  are in  $WE_t$ , then  $\neg A$ ,  $(A \wedge B)$ ,  $(A \vee B)$ ,  $(A \rightarrow B)$ ,  $(A \leftrightarrow B)$  are in  $WE_t$ ;
- (iv) If  $A$  is in  $WE_t$  and  $x$  is a variable of arbitrary type, then  $\forall xA$  and  $\exists xA$  are in  $WE_t$ ;
- (v) If  $\alpha, \beta$  are well-formed expressions of the same type, then  $\alpha = \beta \in WE_t$ ;
- (vi) Nothing else is a well-formed expression.\*

*\*NB: This prevents us from running into Russell's paradox!*



# Type inferencing

Winter: EFS Ch3  
Page 59-60

- Based on the syntactic structure of a sentence, we can derive its logical form, which defines how functions and arguments are combined
- Each expression that constitutes the logical form obtains a type, which can be inferred from the function-argument structure
- Luke is a talented jedi  $\Leftrightarrow^*$  talented'(jedi')(luke')

$$\frac{\text{talented} :: \langle \langle e, t \rangle, \langle e, t \rangle \rangle \quad \text{jedi}' :: \langle e, t \rangle}{\frac{\text{luke}' :: e \quad \text{talented}'(\text{jedi}') :: \langle e, t \rangle}{\text{talented}'(\text{jedi}')(\text{luke}') :: t}}$$

\* Note: we here ignore the semantic contribution of “is” and “a” (see Winter, pg 61)

# Type inferencing: examples

**Recommended strategy:** Start by describing the logical form of the sentences (how are functions and arguments combined, based on the given syntactic bracketing), then derive types for all relevant sub-expressions (see previous slide).

1.  $Yoda_e$  [is faster than  $Palpatine_e$ ].
2.  $Yoda_e$  [is much [faster than]]  $Palpatine_e$ .
3. [[ $Han\ Solo_e$  fights] because [[ $the\ Dark\ Side_e$  is rising]].
4.  $Obi-Wan_e$  [told [ $Qui-Gon\ Jinn_e$ ] he will take [the Jedi-exam] $_e$ ].



# Higher-order predicates

## Higher-order quantification:

- *Leia has the same hair colour as Padmé*

$$\exists C (\text{hair\_colour}(C) \wedge C(l') \wedge C(p'))$$

$\downarrow$                        $\downarrow$   $\downarrow$   
 $\langle\langle e, t \rangle, t\rangle$                $\langle e, t \rangle$   $e$

## Higher-order equality:

- For  $p, q \in \text{CON}_t$ , “ $p=q$ ” expresses material equivalence: “ $p \leftrightarrow q$ ”.
- For  $F, G \in \text{CON}_{\langle e, t \rangle}$ , “ $F=G$ ” expresses co-extensionality: “ $\forall x(Fx \leftrightarrow Gx)$ ”
- For any formula  $\phi$  of type  $t$ ,  $\phi=(x=x)$  is a representation of “ $\phi$  is true”.

# Type Theory: Semantics

Winter: EFS Ch3  
Page 51

## Type domains

- Let  $\mathbf{U}$  be a non-empty set of entities.
- The domain of possible denotations  $\mathbf{D}_\sigma$  for every type  $\sigma$  is given by:
  - $D_e = U$
  - $D_t = \{0, 1\}$
  - $D_{\langle \pi, \sigma \rangle}$  is the set of all functions from  $D_\pi$  to  $D_\sigma$ :  $D_\sigma^{D_\pi}$
- For any type  $\sigma$ , expressions of type  $\sigma$  denote elements of the domain  $\mathbf{D}_\sigma$



# Type Theory: Semantics

## Example domains

- For  $M = \langle U, V \rangle$ , let  $U$  consist of five entities. For selected types, we have the following sets of possible denotations:

- $D_t = \{0, 1\}$

- $D_e = U = \{e_1, e_2, e_3, e_4, e_5\}$

- $D_{\langle e, t \rangle} = \left\{ \begin{bmatrix} e_1 \rightarrow 0 \\ e_2 \rightarrow 0 \\ e_3 \rightarrow 0 \\ e_4 \rightarrow 0 \\ e_5 \rightarrow 0 \end{bmatrix}, \begin{bmatrix} e_1 \rightarrow 1 \\ e_2 \rightarrow 0 \\ e_3 \rightarrow 0 \\ e_4 \rightarrow 0 \\ e_5 \rightarrow 0 \end{bmatrix}, \dots, \begin{bmatrix} e_1 \rightarrow 0 \\ e_2 \rightarrow 1 \\ e_3 \rightarrow 1 \\ e_4 \rightarrow 0 \\ e_5 \rightarrow 1 \end{bmatrix}, \dots, \begin{bmatrix} e_1 \rightarrow 1 \\ e_2 \rightarrow 1 \\ e_3 \rightarrow 0 \\ e_4 \rightarrow 0 \\ e_5 \rightarrow 1 \end{bmatrix}, \dots \right\}$

Equivalent set notation:  $D_{\langle e, t \rangle} = \{\{\}, \{e_1\}, \dots, \{e_2, e_3, e_5\}, \dots, \{e_1, e_2, e_5\}, \dots\}$

# Characteristic functions

Winter: EFS Ch3  
Page 46-47

- Many natural language expressions have a type  $\langle \sigma, \mathbf{t} \rangle$ ; expressing functions that map elements of type  $\sigma$  to truth values:  $\{0,1\}$
- Such functions with a range of  $\{0,1\}$  are called *characteristic functions*, because they uniquely specify a subset of their domain  $\mathbf{D}_\sigma$

The characteristic function of set  $S$  in a domain  $U$  is the function  $F_S: U \rightarrow \{0,1\}$  such that for all  $e \in U$ ,  $F_S(e) = 1$  iff  $e \in S$ .

- NB: For first-order predicates, the FOL denotation (using sets) and the type-theoretic denotation (using characteristic functions) are equivalent.



# Type Theory: Semantics

## Model-theoretic interpretation

- A model structure for a type theoretic language is a tuple  $\mathbf{M} = \langle \mathbf{U}, \mathbf{V} \rangle$  such that:
  - $\mathbf{U}$  is a non-empty domain of individuals
  - $\mathbf{V}$  is an interpretation function, which assigns to every  $\alpha \in \mathbf{CON}_\sigma$  an element of  $\mathbf{D}_\sigma$  (where  $\sigma$  is an arbitrary type)
- The variable assignment function  $\mathbf{g}$  assigns to every typed variable  $\mathbf{v} \in \mathbf{VAR}_\sigma$  an element of the domain  $\mathbf{D}_\sigma$  (where  $\sigma$  is an arbitrary type):  $\mathbf{g} :: \mathbf{VAR}_\sigma \rightarrow \mathbf{D}_\sigma$
- **Interpretation of expressions:** Given model structure  $\mathbf{M} = \langle \mathbf{U}, \mathbf{V} \rangle$  and assignment  $\mathbf{g}$ :
  - $\llbracket \alpha \rrbracket^{\mathbf{M}, \mathbf{g}} = \mathbf{V}(\alpha)$  if  $\alpha$  is a constant
  - $\llbracket \alpha \rrbracket^{\mathbf{M}, \mathbf{g}} = \mathbf{g}(\alpha)$  if  $\alpha$  is a variable
  - $\llbracket \alpha(\beta) \rrbracket^{\mathbf{M}, \mathbf{g}} = \llbracket \alpha \rrbracket^{\mathbf{M}, \mathbf{g}}(\llbracket \beta \rrbracket^{\mathbf{M}, \mathbf{g}})$  *function application*

# Type Theory: Semantics

## Interpretation of formulas

- Given a type-theoretic model structure  $\mathbf{M} = \langle \mathbf{U}, \mathbf{V} \rangle$  and variable assignment  $\mathbf{g}$ :
  - $\llbracket \alpha = \beta \rrbracket^{\mathbf{M}, \mathbf{g}} = 1$  iff  $\llbracket \alpha \rrbracket^{\mathbf{M}, \mathbf{g}} = \llbracket \beta \rrbracket^{\mathbf{M}, \mathbf{g}}$
  - $\llbracket \neg \phi \rrbracket^{\mathbf{M}, \mathbf{g}} = 1$  iff  $\llbracket \phi \rrbracket^{\mathbf{M}, \mathbf{g}} = 0$
  - $\llbracket \phi \wedge \psi \rrbracket^{\mathbf{M}, \mathbf{g}} = 1$  iff  $\llbracket \phi \rrbracket^{\mathbf{M}, \mathbf{g}} = 1$  and  $\llbracket \psi \rrbracket^{\mathbf{M}, \mathbf{g}} = 1$
  - $\llbracket \phi \vee \psi \rrbracket^{\mathbf{M}, \mathbf{g}} = 1$  iff  $\llbracket \phi \rrbracket^{\mathbf{M}, \mathbf{g}} = 1$  or  $\llbracket \psi \rrbracket^{\mathbf{M}, \mathbf{g}} = 1$
  - ...
- For any variable  $\mathbf{v}$  of type  $\sigma$ :
  - $\llbracket \exists \mathbf{v} \phi \rrbracket^{\mathbf{M}, \mathbf{g}} = 1$  iff there is a  $d \in D_\sigma$  such that  $\llbracket \phi \rrbracket^{\mathbf{M}, \mathbf{g}[\mathbf{v}/d]} = 1$
  - $\llbracket \forall \mathbf{v} \phi \rrbracket^{\mathbf{M}, \mathbf{g}} = 1$  iff for all  $d \in D_\sigma$  :  $\llbracket \phi \rrbracket^{\mathbf{M}, \mathbf{g}[\mathbf{v}/d]} = 1$



# Type-theoretic interpretation

## Example

Luke is a talented jedi  $\Leftrightarrow$  talented'  $\langle\langle e, t \rangle, \langle e, t \rangle\rangle$  (jedi'  $\langle e, t \rangle$ ) (luke'  $e$ )

$$\begin{aligned} \llbracket \text{talented}'(\text{jedi}')(\text{luke}') \rrbracket^{M,g} &= \llbracket \text{talented}'(\text{jedi}') \rrbracket^{M,g} (\llbracket \text{luke}' \rrbracket^{M,g}) \\ &= \llbracket \text{talented}' \rrbracket^{M,g} (\llbracket \text{jedi}' \rrbracket^{M,g}) (\llbracket \text{luke}' \rrbracket^{M,g}) = \underline{V_M(\text{talented}')} (\underline{V_M(\text{jedi}')})(V_M(\text{luke}')) \end{aligned}$$

Assume the following denotations:

- $V_M(\text{luke}') = e_1 \ (\in \mathbf{D}_e)$

- $V_M(\text{jedi}') = \begin{bmatrix} e_1 \rightarrow 1 \\ e_2 \rightarrow 0 \\ e_3 \rightarrow 1 \\ e_4 \rightarrow 0 \\ e_5 \rightarrow 1 \end{bmatrix} \ (\in \mathbf{D}_{\langle e, t \rangle})$

- $V_M(\text{talented}') = \begin{bmatrix} e_1 \rightarrow 1 \\ e_2 \rightarrow 0 \\ e_3 \rightarrow 1 \\ e_4 \rightarrow 0 \\ e_5 \rightarrow 1 \end{bmatrix} \rightarrow \begin{bmatrix} e_1 \rightarrow 1 \\ e_2 \rightarrow 0 \\ e_3 \rightarrow 0 \\ e_4 \rightarrow 0 \\ e_5 \rightarrow 1 \end{bmatrix}, \begin{bmatrix} e_1 \rightarrow 0 \\ e_2 \rightarrow 0 \\ e_3 \rightarrow 1 \\ e_4 \rightarrow 1 \\ e_5 \rightarrow 1 \end{bmatrix} \rightarrow \begin{bmatrix} e_1 \rightarrow 0 \\ e_2 \rightarrow 0 \\ e_3 \rightarrow 0 \\ e_4 \rightarrow 0 \\ e_5 \rightarrow 1 \end{bmatrix}, \dots \ (\in \mathbf{D}_{\langle\langle e, t \rangle \langle e, t \rangle\rangle})$

$$\begin{bmatrix} e_1 \rightarrow 1 \\ e_2 \rightarrow 0 \\ e_3 \rightarrow 0 \\ e_4 \rightarrow 0 \\ e_5 \rightarrow 1 \end{bmatrix} (e_1) = 1$$

# Type-theoretic models of natural language

## Defining the right model

Consider the following Model M:

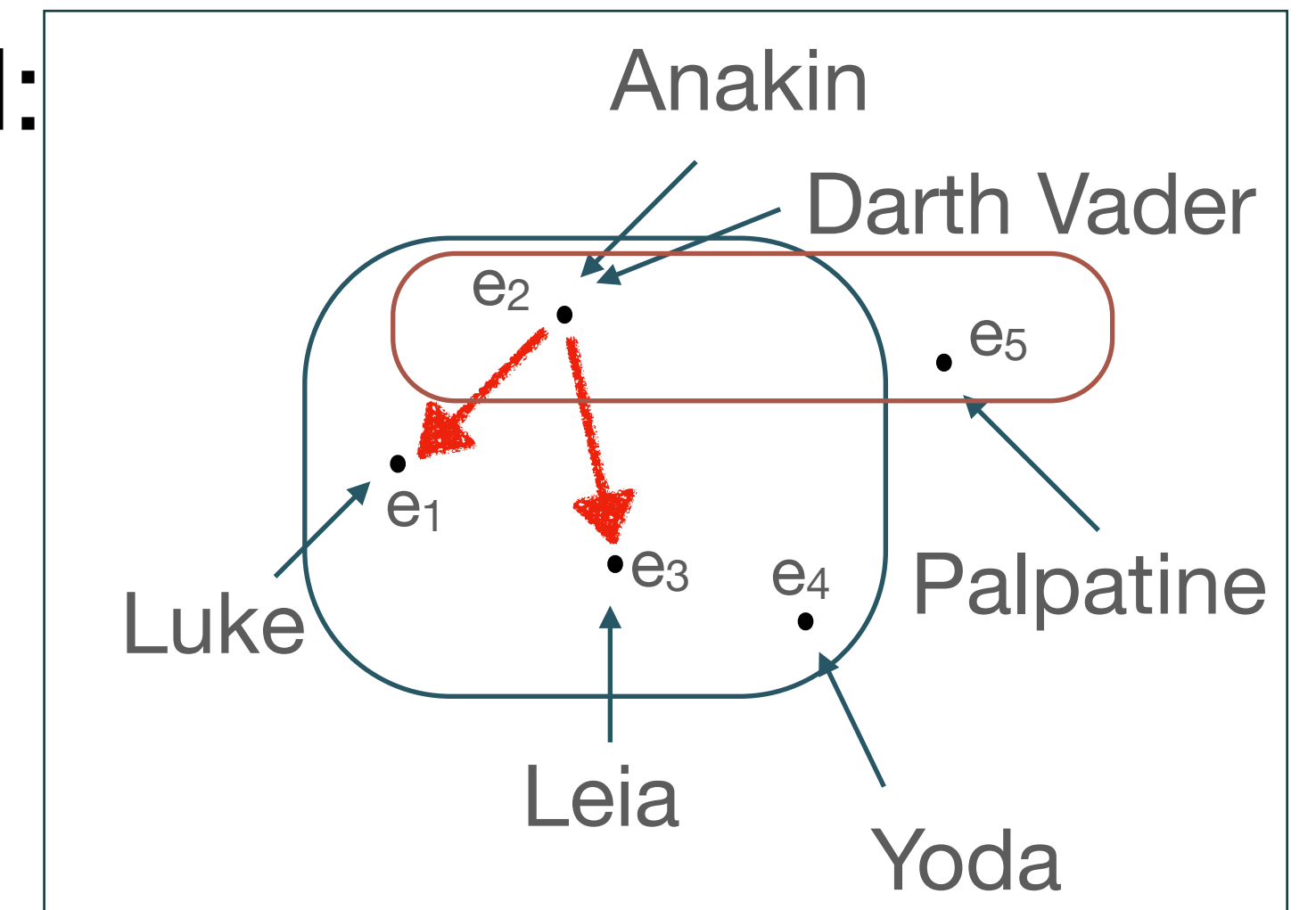
$$D_e = U_M = \{e_1, e_2, e_3, e_4, e_5\}$$

$$V_M(\text{anakin}'_e) = V_M(\text{darth\_vader}'_e) = e_2$$

$$V_M(\text{jedi}'_{\langle e,t \rangle}) = \begin{bmatrix} e_1 \rightarrow 1 \\ e_2 \rightarrow 1 \\ e_3 \rightarrow 1 \\ e_4 \rightarrow 1 \\ e_5 \rightarrow 0 \end{bmatrix} \quad V_M(\text{dark\_sider}'_{\langle e,t \rangle}) = \begin{bmatrix} e_1 \rightarrow 0 \\ e_2 \rightarrow 1 \\ e_3 \rightarrow 0 \\ e_4 \rightarrow 0 \\ e_5 \rightarrow 1 \end{bmatrix}$$

$$V_M(\text{powerful}'_{\langle \langle e,t \rangle \langle e,t \rangle \rangle}) = \left[ \begin{bmatrix} e_1 \rightarrow 1 \\ e_2 \rightarrow 1 \\ e_3 \rightarrow 1 \\ e_4 \rightarrow 1 \\ e_5 \rightarrow 0 \end{bmatrix} \rightarrow \begin{bmatrix} e_1 \rightarrow 0 \\ e_2 \rightarrow 1 \\ e_3 \rightarrow 0 \\ e_4 \rightarrow 1 \\ e_5 \rightarrow 0 \end{bmatrix}, \begin{bmatrix} e_1 \rightarrow 0 \\ e_2 \rightarrow 1 \\ e_3 \rightarrow 0 \\ e_4 \rightarrow 0 \\ e_5 \rightarrow 1 \end{bmatrix} \rightarrow \begin{bmatrix} e_1 \rightarrow 0 \\ e_2 \rightarrow 1 \\ e_3 \rightarrow 0 \\ e_4 \rightarrow 0 \\ e_5 \rightarrow 1 \end{bmatrix}, \dots \right]$$

M:



Note that “powerful” is defined to be truth-preserving: Powerful  $X_{\langle e,t \rangle} \models X_{\langle e,t \rangle}$

# Meaning postulates

## Restricting denotations

- Some valid inferences in natural language:
    - Bill is a poor piano player  $\models$  Bill is a piano player
    - Bill is a blond piano player  $\models$  Bill is blond
    - Bill is a former professor  $\models$  Bill isn't a professor
- These entailments do not hold in type theory by definition.

**Meaning postulates:** Restrictions on models that constrain the possible meanings of certain words



# Meaning postulates for adjective classes

- **Restrictive or subsective adjectives** (e.g., “poor”)
  - Restriction:  $\llbracket \text{poor } N \rrbracket \subseteq \llbracket N \rrbracket$
  - Meaning postulate:  $\forall G \forall x (\text{poor}(G)(x) \rightarrow G(x))$
- **Intersective adjectives** (e.g., “blond”)
  - Restriction:  $\llbracket \text{blond } N \rrbracket = \llbracket \text{blond} \rrbracket \cap \llbracket N \rrbracket$
  - Meaning postulate:  $\forall G \forall x (\text{blond}(G)(x) \rightarrow (\text{blond}^*(x) \wedge G(x)))$
  - NB:  $\text{blond} \in WE_{\langle\langle e, t \rangle, \langle e, t \rangle\rangle} \neq \text{blond}^* \in WE_{\langle e, t \rangle}$
- **Privative adjectives** (e.g., “former”)
  - Restriction:  $\llbracket \text{former } N \rrbracket \cap \llbracket N \rrbracket = \emptyset$
  - Meaning postulate:  $\forall G \forall x (\text{former}(G)(x) \rightarrow \neg G(x))$

# Reading material

## Recommended reading

- Winter: Elements of Formal Semantics (Chapter 3, Part I & II)  
<http://www.phil.uu.nl/~yoad/efs/main.html>